



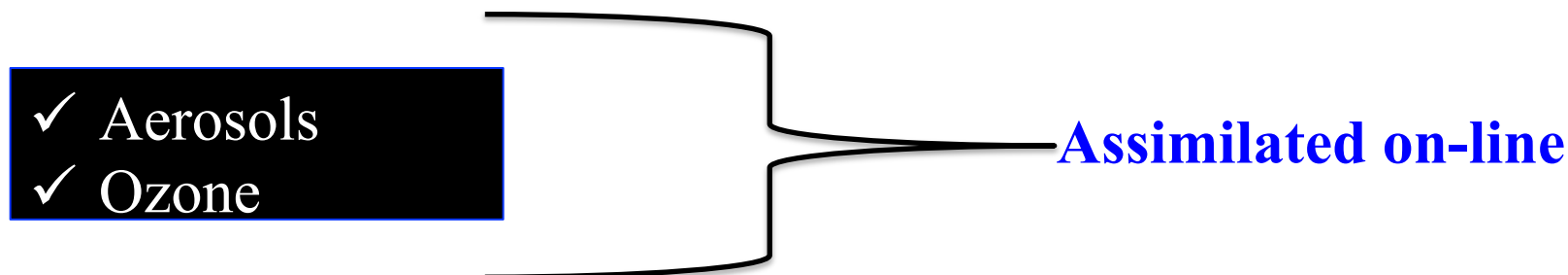
# **Coupled Data Assimilation & Prediction Systems at the GMAO-NASA**

GMAO, NASA-GSFC  
(presented by Santha Akella)

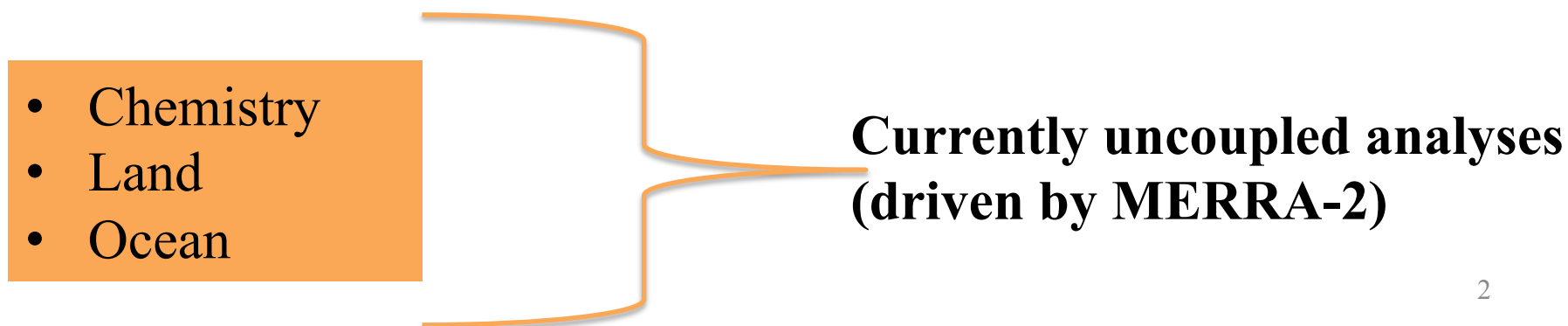


# Outline

- Brief overview of MERRA-2
- Coupled components in MERRA-2



- Integrated Earth System Analysis (**IESA**). Full coupling:





# MERRA-2: System

**GEOS-ADAS-5.12.4:** GEOS-AGCM ( $0.5^\circ \times 0.625^\circ$  L72), GSI (3D-Var)

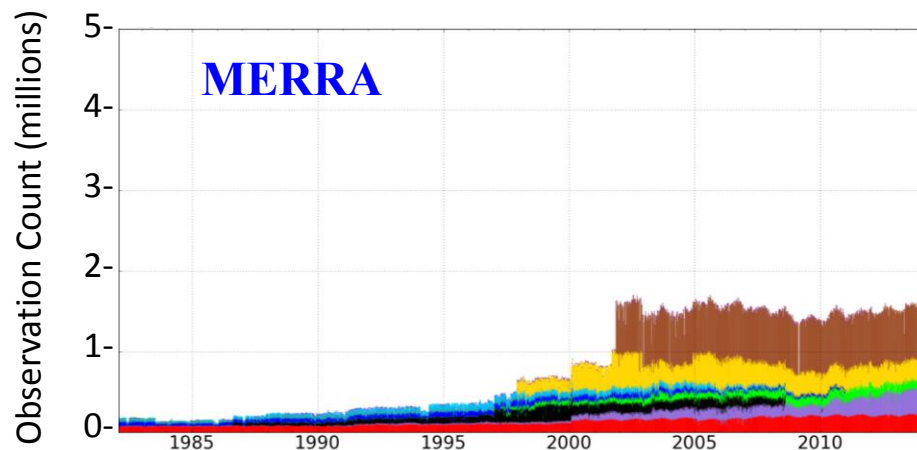
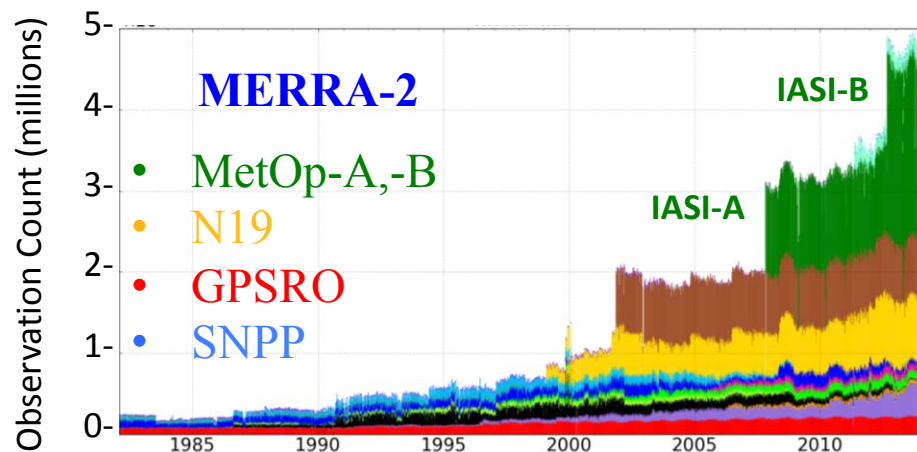
**Key updates** (model, analysis, and observations):

- Cubed-sphere dynamics
  - Updated physics: convection, re-evap of rain, snow sublimation
  - New moisture control variable
  - Bias correction for aircraft temperature observations
  - More observations: MetOp-B/SNPP, GPSRO, AuraOMI/MLS
  - **Constraints on dry mass and globally integrated water** for improved hydrology
- **Aerosol assimilation**, radiatively coupled to AGCM (direct effects)
  - **Observation-corrected precipitation** for surface forcing and aerosol deposition over ocean
  - Improved glacier model and sea-ice albedos
  - Daily,  $\frac{1}{4}^\circ$ - ocean boundary conditions (SST, Sea Ice Concen.)



# MERRA-2: Input, Output

## Assimilated Observations



## Data Delivery

- 1980- present, run with 2- 3 week latency
- Hourly 2D fields (surface)
- 3- and 6-hourly 3D fields

Daily Products	~25 GB/day	9.1 TB/year
Monthly Products	~34 GB/day	408 GB/year



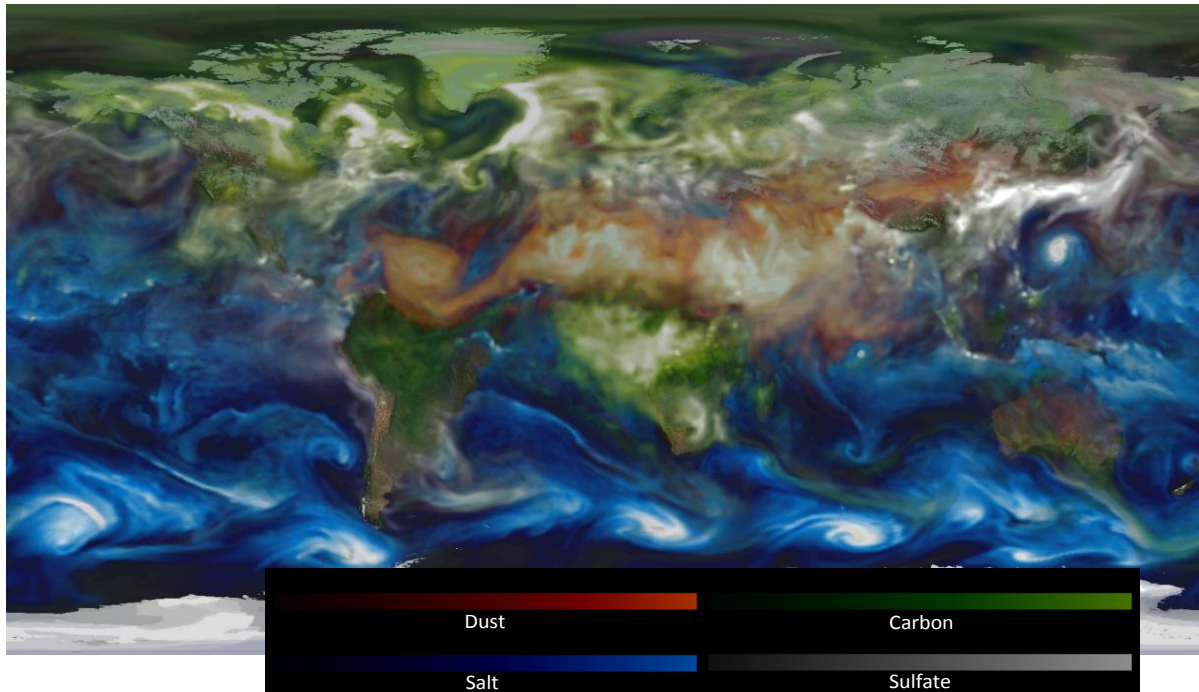


# MERRA-2: Coupled components



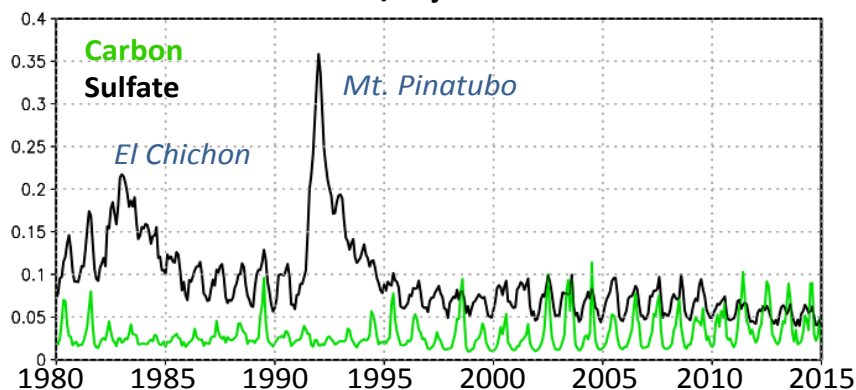
## Aerosol Assimilation

MERRA-2 Aerosol Analysis 10 July 2013 1200UTC

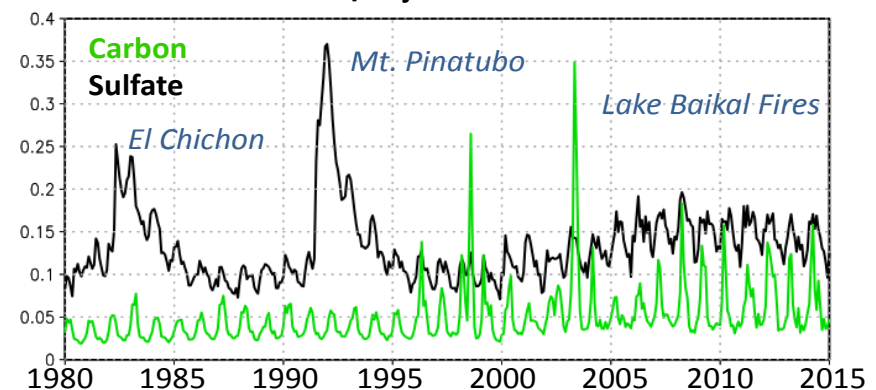


- **Black and organic carbon**, **dust**, **sea salt**, sulfates
- GOCART – mixing, chemistry and deposition
- Actively assimilated AOD from AVHRR, MODIS, MISR, AERONET
- Aerosols radiatively coupled with atmospheric model dynamics

North America/Adjacent Atlantic AOD



East Asia/Adjacent Pacific AOD



# MERRA-2: Coupled components

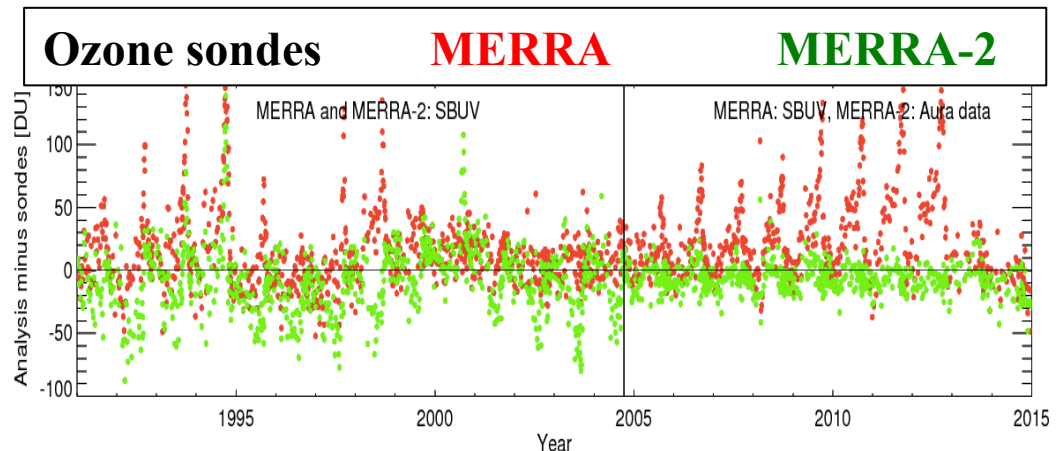
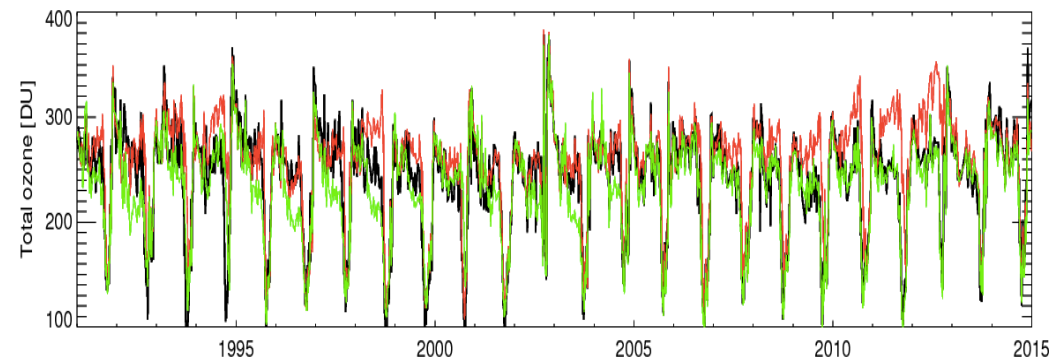


## Ozone Assimilation

Partial/total column	SBUV	1980-2004
Total column	OMI	2004- ...
Profiles	MLS	2004- ...

MERRA-2 better agrees with sonde data 2005 onwards when EOS Aura MLS and OMI observations are assimilated

### South Pole Total Column Ozone



	1991-2004	2005-2014
Sondes-Analysis difference	14.03 DU -6.72 DU	26.56 DU -6.77
Std. Dev of the sonde-analysis differences	30.19 DU 28.23 DU	36.00 11.10

# MERRA-2: “loosely coupled”

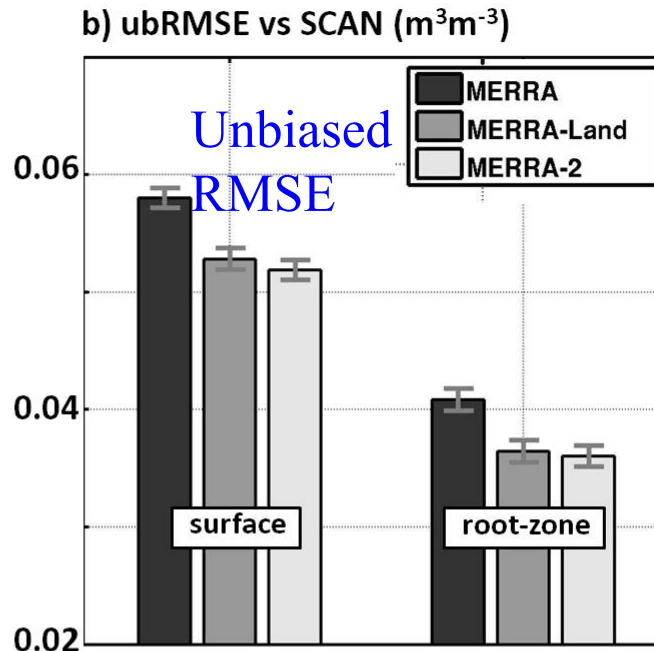
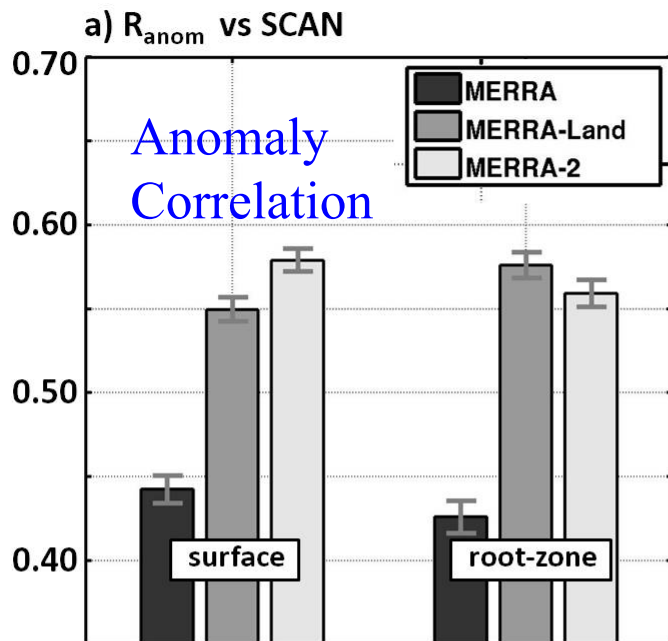


## Precipitation Correction

- to match gauge and/or satellite obs- it is *incident* at surface
- improves land hydrology and positively feeds back to atmospheric fields

Comparison w.r.t. SCAN in-situ observations (in US, 2002-2014)

### Soil Moisture (near-surface & root-zone)



### MERRA-Land:

- land only replay of MERRA
- included precip corrections



# IESA: Full Coupling

**Integrated Earth System Analysis** of  
currently uncoupled assimilation systems (driven by MERRA-2):

1. Chemistry (CO, CO<sub>2</sub>), Carbon cycle
  2. Land (surface fields), soil and snow states
  3. Ocean (physical) state
- ✧ Ocean bio-geo-chemistry (relies on items 1 and 3)  
- More on this.. if time permits

# IESA: Chemistry (CO, CO<sub>2</sub>, ...)



**Plan:** fully coupled Carbon DA & Atmospheric DAS

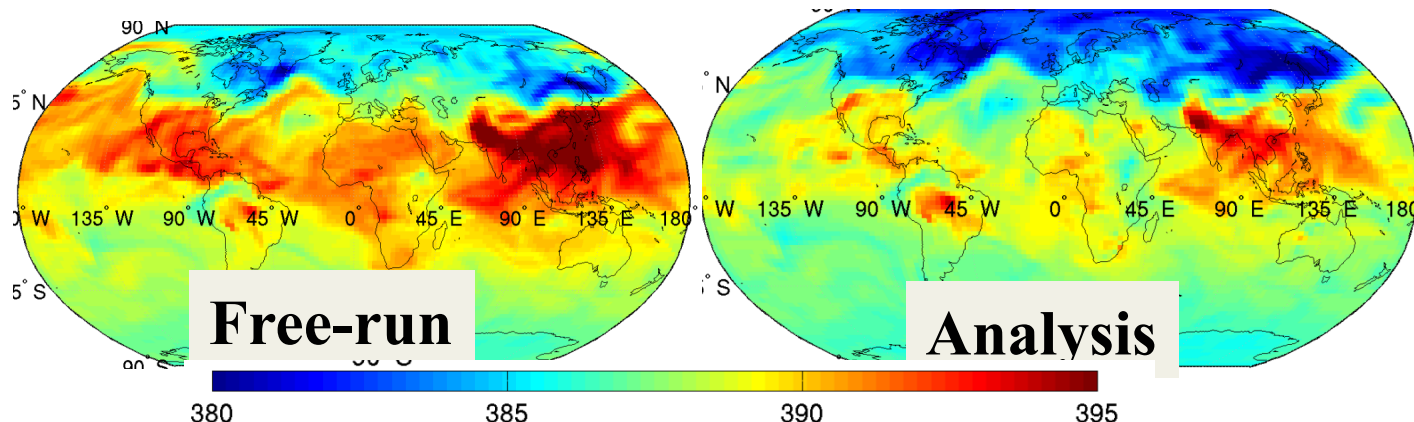
## Priorities:

- Assimilate **column-averaged CO<sub>2</sub> retrievals** from GOSAT, OCO-2
- **Direct radiance assimilation** of OCO-2 observations

## Issues:

- **Retrieval:** latency (24- 48 hrs) and biases; but regional data
- **Underestimation** of the **summer drawdown** by **boreal forests**- well known deficiency of land carbon models.

XCO<sub>2</sub> (ppmv) Aug 4, 2010- 12 UTC



Assimilation  
of GOSAT CO<sub>2</sub>  
reduces bias  
over N Hem





# IESA: Land Surface

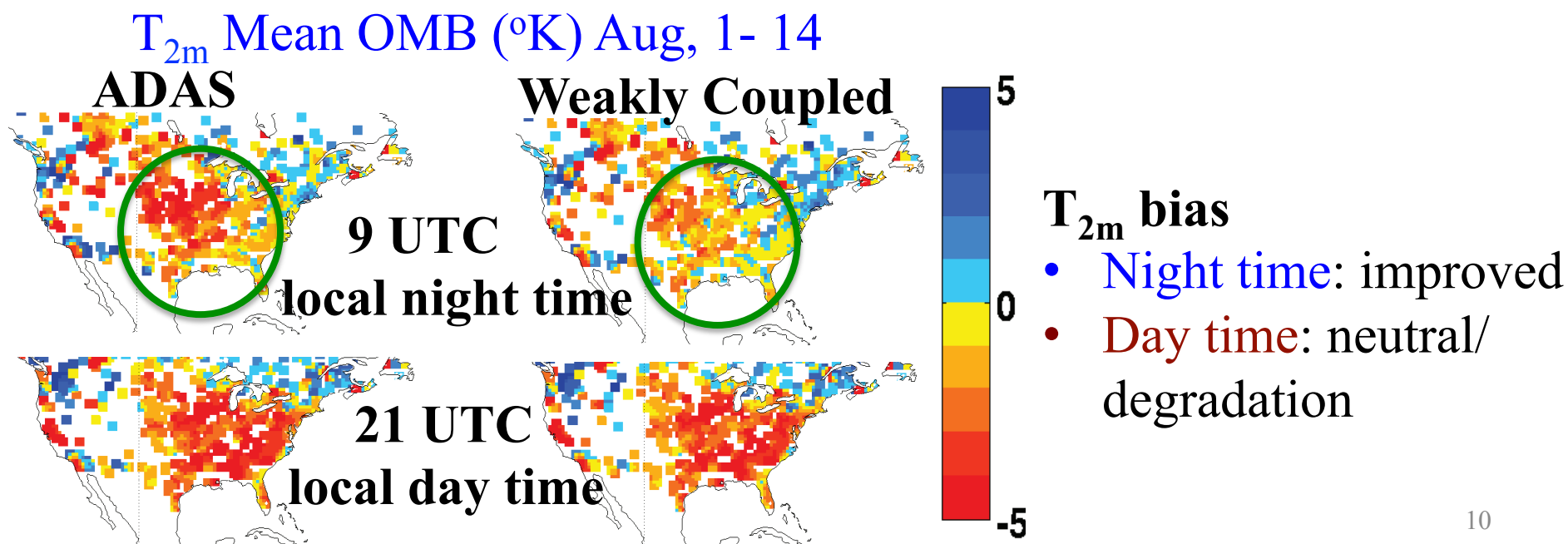
**Plan:** weakly coupled Land DA & Atmospheric DAS

## Priorities:

- Near-surface soil moisture and snow cover fraction

## Issues:

- Calibration and validation of heterogeneous surface with sparse obs
- Reconcile differences between model and observed variables

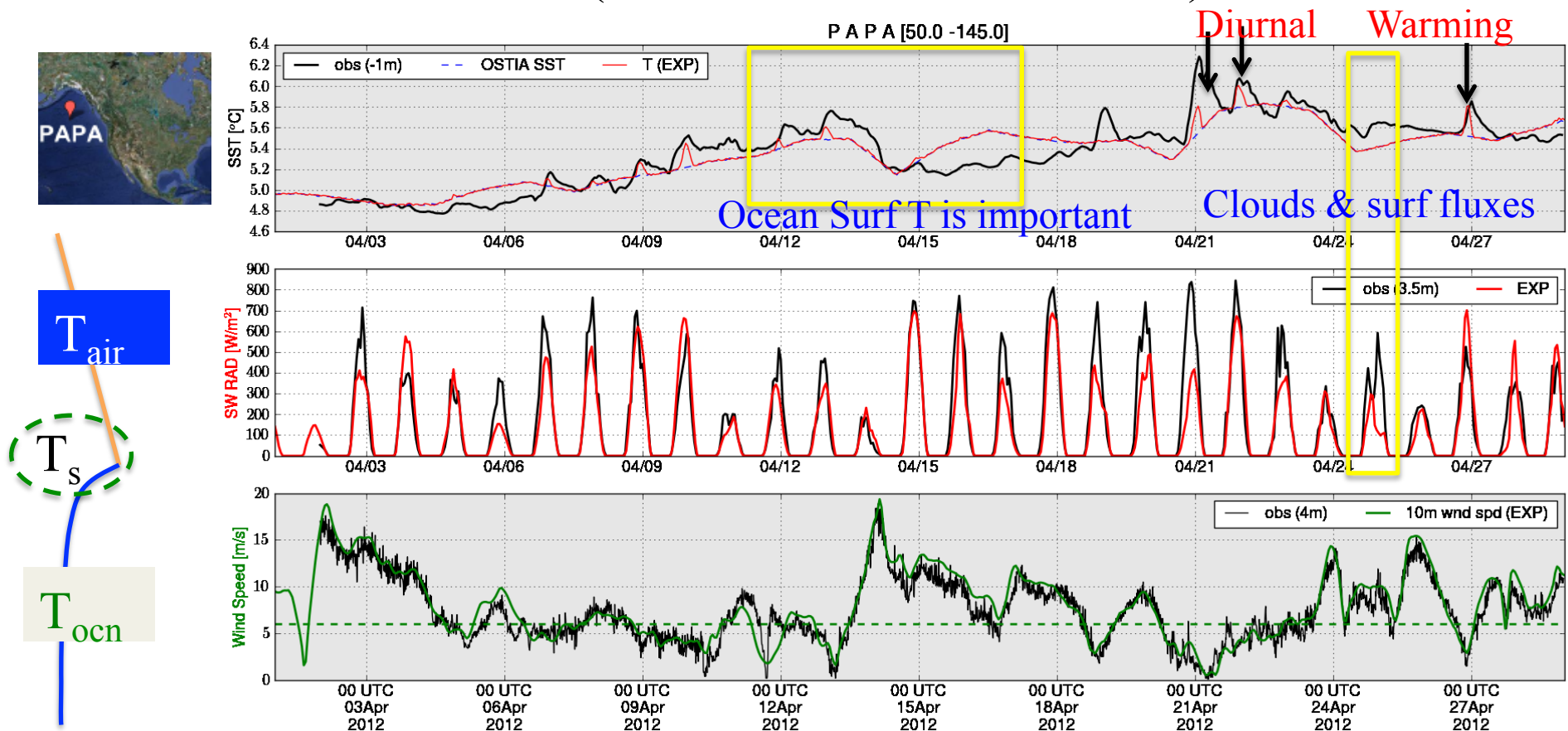


# IESA: Ocean



**Plan:** weakly coupled Ocean DA & Atmospheric DAS

- **Ocean surface T** = Ocean T (z=1) + Ocean Ana Increment
- ✓ Skin SST ( $T_s$ ) = **Ocean surface T** + **Diurnal warming** – **Cool skin** + **Atmos Ana Increment** (direct radiance assimilation)





# Closing Remarks

- Ongoing work toward IESA
  - Chemistry
  - Land
  - Ocean
  - Ocean Bio-Geo-Chem

As predictions improve- across interfaces, analyses (sub-) components are modularly integrated (**ESMF**) into the GMAO systems:

- Weather forecasts
- S2S,
- Reanalysis (MERRA-3, ...)



# BACKUP SLIDES



## **MERRA-2-Ocean**

(coupled AO-GCM replayed to  
MERRA-2 atmospheric analysis)



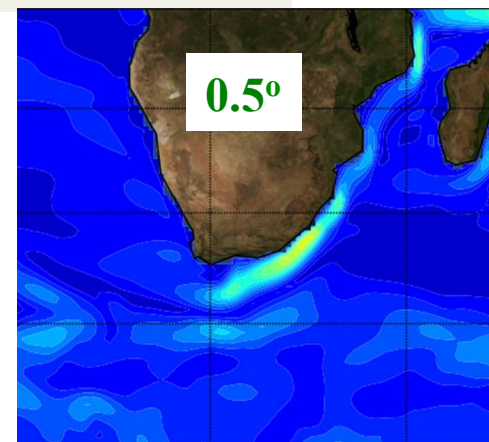
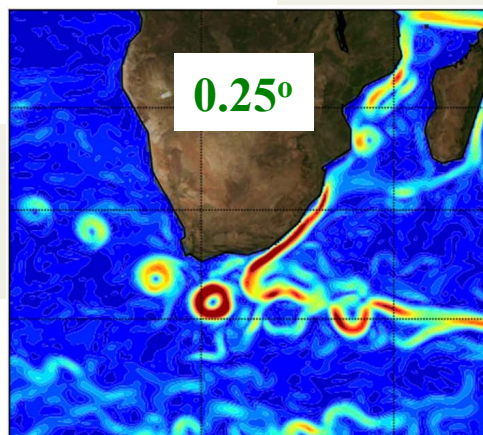
# MERRA-2-Ocean: Plan

## AO-GCM configuration

	MERRA-2-Ocean	MERRA-Ocean
Atmosphere	MERRA-2 replay	MERRA replay
Ocean	MOM5 ( <i>or 6?</i> )	MOM4-p1
Ocean res	0.25° tripolar; L50	0.5° tripolar; L40
Sea-Ice	LANL CICE 4.1 ( <i>or 5.1.2?</i> )	LANL CICE 4.1
Run-off	Ice-sheets + Rivers	Rivers

### Ocean Surface Currents

**Eddy  
Permitting**





# MERRA-2-Ocean: Plan

## Assimilation of observations

	MERRA-2-Ocean	MERRA-Ocean
SST	OSTIA ( <i>or Reynolds? or L2</i> )	Reynolds
Sea-Ice Concentration	NSIDC ( <i>or Reynolds/SAF?</i> )	NSIDC
Sea Level Anomaly ( <i>or Abs. Dyn. Topo.?</i> )	AVISO	AVISO
Sea Surface Salinity	<i>Pre-processed Aquarius?</i>	-None-

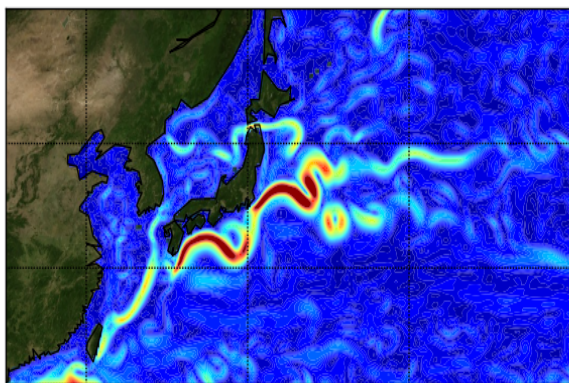
## In-situ

T&S (CTD, TAO, PIRATA, RAMA, ARGO; XBT-T)



# MERRA-2-Ocean: Issues

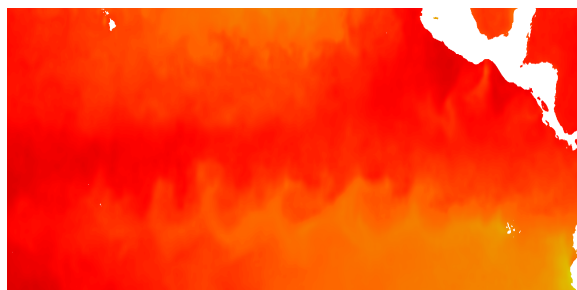
- Effectively constrain meso-scale features



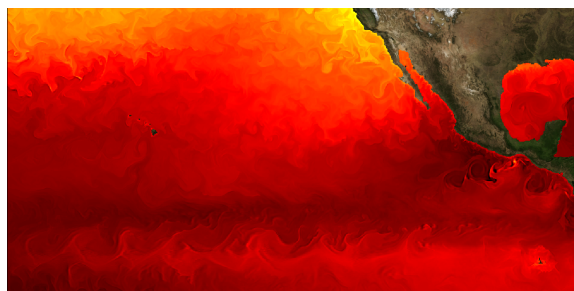
**Need to assimilate  
along track  
altimeter SSH (ADT)**

- Gridded SST (Optimal-interpolation products)

**0.05° OSTIA SST  
(1 Jan, 2014)**



**0.1° AXIOM-1 SST  
(1 Jan, 2014)**



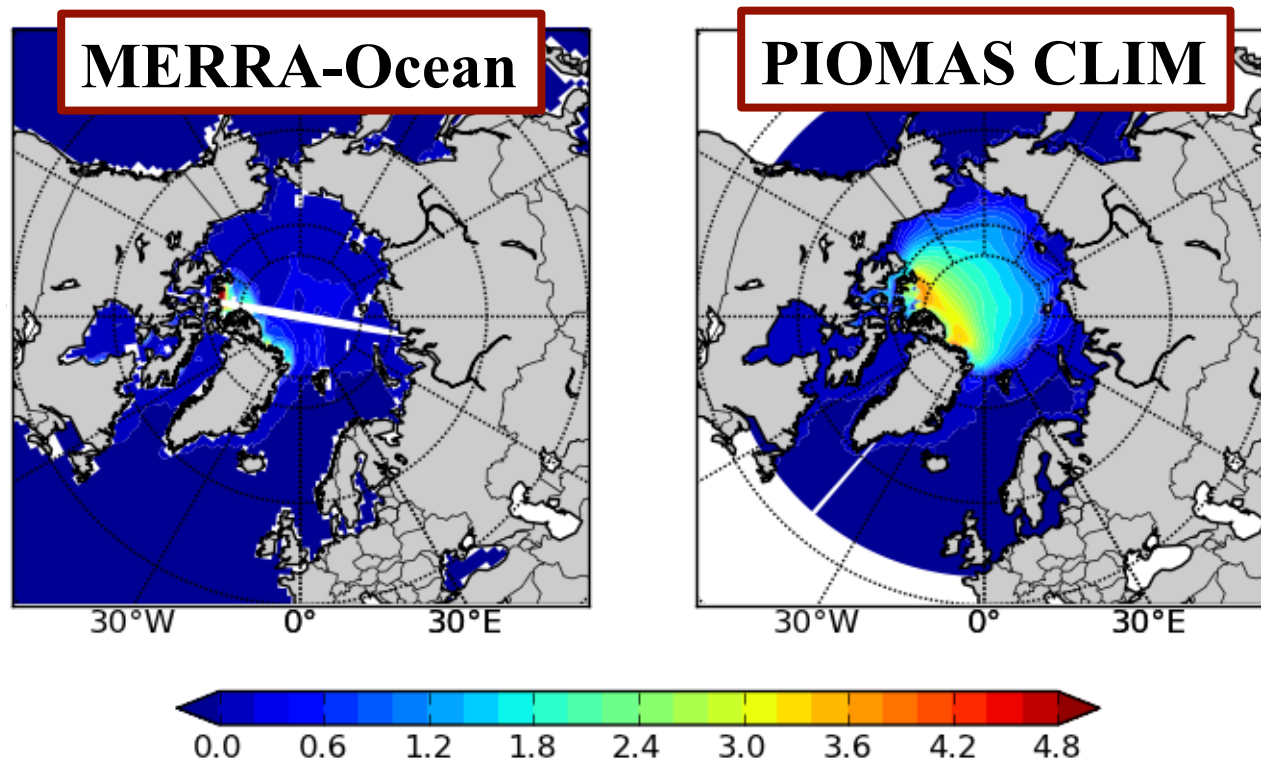
**Need to assimilate  
along track SST**

# MERRA-2-Ocean: Issues



- Sea Ice Concentration: assimilated (NSIDC, NASA Team-2 product)
- Sea Ice Thickness distribution: **un**constrained

Sea Ice Thickness (m)  
(Aug, 2015 Monthly Mean)



Thickness significantly differs from climatology (PIOMAS):

- *Assimilate CRYOSAT-2 freeboard?*
- *Calibrate CICE parameters?* <sup>17</sup>



EXTRA

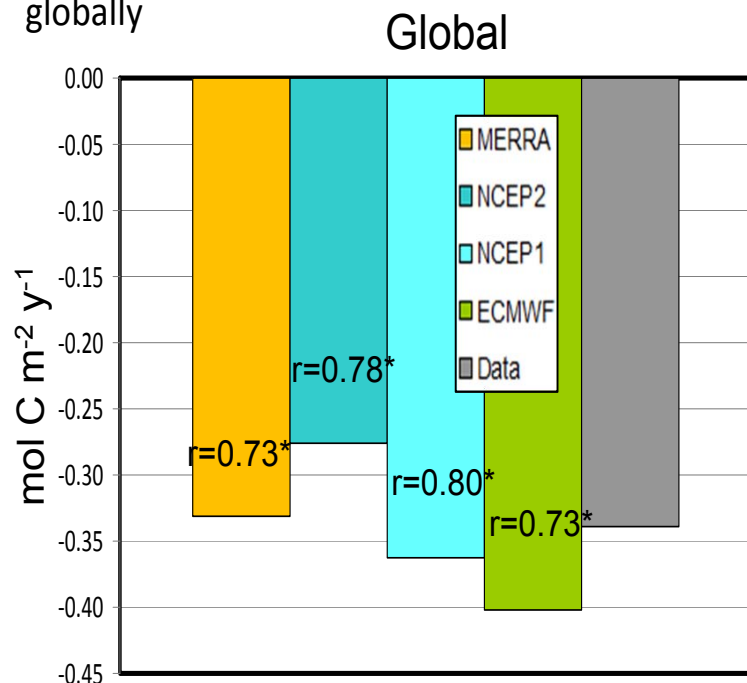


# IESA: Ocean bio-geo-chemistry



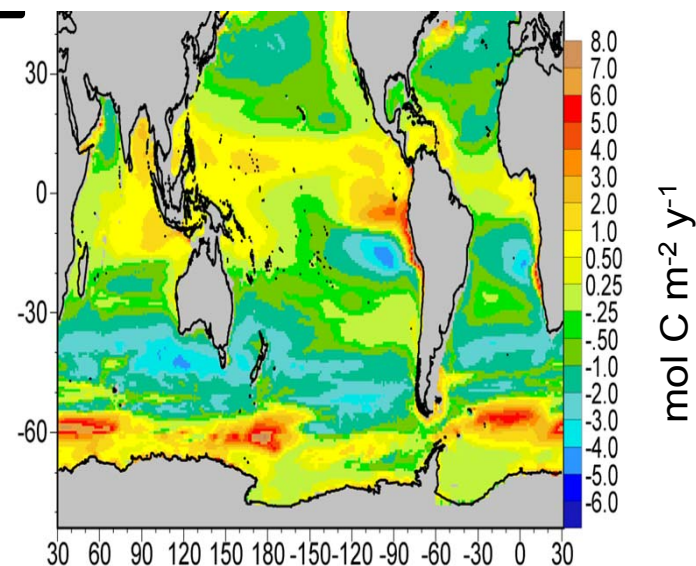
## Existing Product:

- Ocean  $p\text{CO}_2$  and  $\text{CO}_2$  fluxes from the NOBM-Poseidon
- Publicly available at [carbon.nasa.gov](http://carbon.nasa.gov) for 2003-2012
- Current  $p\text{CO}_2$  and  $\text{CO}_2$  fluxes show agreement with in situ data
- Different reanalysis forcing data produce flux estimates within 20% globally



## Development:

- $p\text{CO}_2$  and  $\text{CO}_2$  fluxes from the NOBM using Modular Ocean Model (both offline using Carbon Tracker data and online using GEOS-5)



Ship based estimate  
Of  $\text{CO}_2$  fluxes (Takahashi et al., 2006)

